EIGENVALUES, EIGENVECTORS, AND EIGENSPACES

Defn: Let L: V -> V be a linear operator on vector space V. A nonzero vector veV is an eigenvector with eigenvalue & when L(v) = Lv.

Recall that an nxn matrix determines a linear transformation Ln: R"-> TR" where Repen, En (Lm) = M. When we discuss the eigenvalues or eigenvectors of a matrix, we mean the corresponding object for the transformation Ln. Note that the correspondence between nxn matrices and linear operators on IRn allows us to work primarily with matrices from now on.

Exi Let M = [1 0] Noting that

 $M \begin{vmatrix} 1 \\ 1 \end{vmatrix} = \begin{bmatrix} 1 & 1 & 0 \\ 1 & 0 & 1 \\ 0 & 1 & 1 \end{bmatrix} \begin{bmatrix} 1 \\ 1 \end{bmatrix} = \begin{bmatrix} 2 \\ 2 \\ 2 \end{bmatrix} = 2 \begin{bmatrix} 1 \\ 1 \end{bmatrix}, \text{ ne See that}$

 $V = \begin{bmatrix} 1 \\ 1 \end{bmatrix}$ is an eigenvector of M with eigenvalue $\lambda = 2$.

Note that each eigenvalue of Myields a subspace of R?

Profilet) be a scalar and L:V-V a linear operator.

The set $V_{\lambda} := \{u \in V : L(u) = \lambda u\}$ is a subspace of V.

Pf: We apply the subspace test. In particular, given two elements u, v e V, and scalar a, we comple

L(u+av) = L(u) + aL(v)

= \ \ \ + \ \ (\ \ \ \)

= \n + (a)) V

= \(\lambda \) + (\(\lambda \alpha \) \(\forall \) $= \lambda u + \lambda (av)$

= \((n + av)

(by linearity of L)

(definition of Vx)

(vector space axiom)

(Commute multiplication)

(Vector space axion)

(scalar distribution)

utave Vx. Note also Hence $L(u+av) = \lambda(u+av)$ yields Hence Vx = V as desired. $L(0) = 0, -\lambda.0, so 0, \in V_{\lambda} \neq \emptyset$

Defu: The spaces $V_{\lambda} := \{u \in V : L(u) = \lambda u\}$ are eigenspaces. Observation: If UEV, NVn and V+O, then $\lambda v = L(v) = \mu v$. Thus $(\lambda - \mu)v = \lambda v - \mu v = \omega_v$, so we have $\lambda - n = 0$, i.e. $\lambda = M$. In particular, eigenspaces of distinct eigenvalues have only the zero vector in common " At this point, we've seen an example and played with some theory. But how do we compute eigenvalues and eigenspaces? If v is an eigenvector of M with eigenvalue), then Mv = lv. Subtracting lv we obtain $O_{\nu} = M_{\nu} - \lambda \nu = M_{\nu} - \lambda \mathcal{I}_{\nu} = (M - \lambda \mathcal{I}) \nu.$ From this we've learned two new facts. O If λ is an eigenvalue of M, then $M-\lambda I$ is singular. ② Every eigenvector of M with eigenvalue I is in null(M-XI). For the moment let's focus on condition \bigcirc . The matrix $M-\lambda I$ is singular if and only if $det(M-\lambda I)=0$. This simple observation leads us to make a definition. Defor The characteristic polynomial of an nxn matrix M is $P_{M}(\lambda) := det(M - \lambda I)$ where λ is a variable. Now we formalize our observation from above. Prop: Let M be a matrix. A scalar h is an eigenvalue of M if and only h is a root of Pn. Point: To compute eigenvalues, we need only compute roots of Pn "

Ex: Compute the eigenvelues of
$$M = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 1 \end{bmatrix}$$

Sol: First we compute the characteristic polynomial of M .

$$P_{M}(\lambda) = \det \begin{pmatrix} M - \lambda T \end{pmatrix} = \det \begin{pmatrix} \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 1 \end{bmatrix} - \lambda \begin{bmatrix} 1 & 0 & 0 \\ 0 & 0 & 1 \end{bmatrix} \end{pmatrix}$$

$$= \det \begin{pmatrix} \begin{bmatrix} 1 - \lambda & 1 & 0 \\ 1 & -\lambda & 1 \\ 0 & 1 & 1 - \lambda \end{pmatrix}$$

$$= \det \begin{pmatrix} \begin{bmatrix} 1 - \lambda & 1 & 0 \\ 0 & 1 & 1 - \lambda \end{pmatrix} - \det \begin{pmatrix} 1 & 1 & 1 \\ 0 & 1 & -\lambda \end{pmatrix} + O$$

$$= \det \begin{pmatrix} 1 - \lambda & 1 & 0 \\ 1 & 1 - \lambda & 1 \end{pmatrix} - \det \begin{pmatrix} 1 - \lambda & 1 \\ 0 & 1 - \lambda \end{pmatrix} + O$$

$$= \det \begin{pmatrix} 1 - \lambda & 1 & 1 \\ 1 & 1 - \lambda & 1 \end{pmatrix} - \det \begin{pmatrix} 1 - \lambda & 1 \\ 0 & 1 - \lambda \end{pmatrix} + O$$

$$= -(1 - \lambda) \begin{pmatrix} 1 + \lambda - \lambda^{2} + 1 \end{pmatrix}$$

$$= + (1 - \lambda) \begin{pmatrix} 1 + \lambda - \lambda^{2} + 1 \end{pmatrix}$$

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$$= -(\lambda + 1) (\lambda - 1) (\lambda - 2)$$
is the characteristic polynomial.

Now we compute the eigenvalues of M by solving $P_{M}(\lambda) = O$:

$$P_{M}(\lambda) = O \iff -(\lambda + 1) (\lambda - 1) (\lambda - 2) = O$$

$$A = -1 \qquad OR \qquad \lambda - 1 = O \qquad OR \qquad \lambda - 2 = O$$

$$A = -1 \qquad OR \qquad \lambda - 1 = O \qquad OR \qquad \lambda - 2 = O$$

$$A = -1 \qquad OR \qquad \lambda - 1 = O \qquad A = Z$$
Thence M has eigenvalues $A = -1$, $A = 1$, and $A = Z$. M

$$Ex: A = \begin{bmatrix} 1 & 1 \\ 0 & 1 \end{pmatrix}$$
 has $P_{M}(\lambda) = \det (A - \lambda T) = \det \begin{bmatrix} 1 - \lambda \\ 0 & 1 - \lambda \end{bmatrix} = (1 - \lambda)^{2}$, so $\lambda = 1$ is the only eigenvalue of A .

Ex:
$$B = \begin{bmatrix} 1 & 1 \end{bmatrix}$$
 has characteristic polynomial $P_B(\lambda) = dk! (B-\lambda I) = dk! \begin{bmatrix} 1-\lambda & 2-\lambda \end{bmatrix} = (1-\lambda)^2 - 2$.

Hence we compute expensiones as follows:

$$P_B(\lambda) = 0 \iff (1-\lambda)^2 - 2 = 0$$

$$\iff (1-\lambda)^2 = 2$$

$$\iff (1-\lambda)^2 = 2$$

$$\iff \lambda = 1 \pm 12$$
Thus B has eigenvalues $\lambda = 1 \pm 12$.

Ex: $C = \begin{bmatrix} 1 & 3 \\ -1 & 2 \end{bmatrix}$ has characteristic polynomial $P_C(\lambda) = dk! (C-\lambda I)$

$$= dk! \begin{bmatrix} 1-\lambda & 3 \\ -1-\lambda & 2-\lambda \end{bmatrix}$$
where $P_C(\lambda) = dk! (C-\lambda I)$

$$= (1-\lambda)(2-\lambda) - (-1)(3)$$

$$= (1-\lambda)(2-\lambda) - (-1)(3)$$

$$= (1-\lambda)(2-\lambda) + (-1)(3)$$
Suppose $P_C(\lambda) = (\lambda - \frac{3}{2})^2 + (S - \frac{3}{4})$

$$= (\lambda - \frac{3}{2})^2 + (S - \frac{3}{4})$$
Hence $P_C(\lambda) - (\lambda - \frac{3}{2})^2 + \frac{11}{4}$, which has complex roots!

In the list example indicates eigenvalues can be complex!

To the last example indicates eigenvalues can be complex!

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To the last example indicates eigenvalues can be complex!

and Vx is a complex vector space now

At this point we know how to comple eigenvalues via the characteristic polynomial. But what about eigenvectors and eigenspaces? For that we formalize observation 2) from earlier. Propi Let M be an non matrix with eigenvalue). The eigenspace of M associated to A is $V_A = null (M-\lambda I)$. Point: To calculate the eigenspaces of M we must @ Compute Pm (x). (b) solve Pm(X) = 0 for eigenvalues. © For each eigenvalue à compute null (M-1I). Ex: Let M = []. Then the characteristic polynomial $P_{m}(\lambda) = det \begin{bmatrix} 1-\lambda & 1\\ 1 & 1-\lambda \end{bmatrix} = (1-\lambda)^{2} - 1 = \lambda(\lambda-2).$ Thus M has eigenvalues $\lambda = 0$ and $\lambda = 2$. We must now compute eigenspaces separately via $V_{\lambda} = null (M - \lambda I)$. $\sum = 0: \quad M - OI = \begin{bmatrix} 1 & 1 \\ 1 & 1 \end{bmatrix} \quad has \quad RREF(M - OI) = \begin{bmatrix} 1 & 0 \\ 0 & 0 \end{bmatrix},$ $So \quad \begin{bmatrix} x \\ y \end{bmatrix} \in null(M - OI) \iff x + y = 0 \iff x = -y.$ Hence [[i]] is a basis for $V_0 = \text{null}(M - OI)$. $\lambda = 2$: $M - 2I = \begin{bmatrix} 1 \\ 1 \end{bmatrix}$ has $RREF(M-2I) = \begin{bmatrix} 1 \\ 0 \end{bmatrix}$ 50 [x] = null (M-ZI) (=> x-y=0 (=> x=y Hence $\{[i]\}$ is a basis for $V_2 = null(M-2I)$. this $V_0 = Span \left\{ \begin{bmatrix} i \end{bmatrix} \right\}$ and $V_2 = Span \left\{ \begin{bmatrix} i \end{bmatrix} \right\}$.

Ex: Co-ple the eigenspaces of
$$M = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 1 \end{bmatrix}$$
.

Sol: Earlier we compled eigenvalues $\lambda = -1, 1, 2$.

 $\lambda = -1$: RREF $(M + I)$ > RREF $\begin{bmatrix} 2 & 1 & 0 \\ 0 & 1 & 1 \end{bmatrix} = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}$.

Hence $\begin{bmatrix} 21 \\ 31 \end{bmatrix}$ & roll $(M + I)$ \hookrightarrow $\begin{bmatrix} 2 & 0 & 0 \\ 2 & 1 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}$.

 $\lambda = 1$: RREF $(M - I)$ = RREF $\begin{bmatrix} 0 & 1 & 0 \\ 0 & 1 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}$.

 $\lambda = 2$: RREF $(M - 2I)$ = RREF $\begin{bmatrix} 0 & 1 & 0 \\ 0 & 1 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & -1 \\ 0 & 0 & 0 \end{bmatrix}$.

Hence $\begin{bmatrix} 21 \\ 31 \end{bmatrix}$ & roll $(M - 2I)$ \hookrightarrow $\begin{bmatrix} 0 & 0 & 0 \\ 0 & 1 & 0 \end{bmatrix} = \begin{bmatrix} 0 & 0 & -1 \\ 0 & 0 & 0 \end{bmatrix}$.

This fishes the Completion of eigenspaces of M .

Ex: Complete the eigenspaces of $F = \begin{bmatrix} 0 & 1 \\ 0 & 1 \end{bmatrix} = -\lambda(1 - \lambda) - 11 = \lambda^2 - \lambda - 1$

has roots $\lambda = \frac{-(-1) \pm \sqrt{(-1)^2 - 4(1)(-1)}}{2(1)} = \frac{1 \pm \sqrt{3}}{2}$ by the quadratic formula.

Hence we complete the eigenspaces for these eigenvalues below.

 $\lambda = \frac{1 + \sqrt{3}}{2}$: We complete an echelon form of $F - \lambda I$:

 $1 - \frac{1 + \sqrt{3}}{2}$: We complete an echelon form of $F - \lambda I$:

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 $1 - \frac{1 + \sqrt{3}}{2}$: Such that have $V_{\frac{10}{2}} = -5 p_{10} \left\{ \begin{bmatrix} 1 - \sqrt{3} \\ -2 \end{bmatrix} \right\}$.

$$\lambda = \frac{1 - \sqrt{5}}{2}. \quad \text{We comple an echelon form for } F - \lambda I:$$

$$\begin{bmatrix} -\frac{1 - \sqrt{5}}{2} & 1 \\ 1 & 1 - \frac{1 - \sqrt{5}}{2} \end{bmatrix} \longrightarrow \begin{bmatrix} -1 + \sqrt{5} & 2 \\ 2 & 1 + \sqrt{5} \end{bmatrix} \longrightarrow \begin{bmatrix} 2 & 1 + \sqrt{5} \\ 0 & 0 \end{bmatrix}$$

Hence
$$\begin{bmatrix} x \\ y \end{bmatrix} \in \text{Null} \left(\overline{\Gamma} - \lambda \overline{I} \right) \iff 2x + (1+\sqrt{5})y = 0$$

$$\iff \begin{bmatrix} x \\ y \end{bmatrix} = t \begin{bmatrix} 1+\sqrt{5} \\ -2 \end{bmatrix} \quad \text{Some} \quad t$$

This we have
$$V_{\frac{1-\sqrt{5}}{2}} = Span \left\{ \begin{bmatrix} 1 + \sqrt{5} \\ -2 \end{bmatrix} \right\}$$
.

Ex: Comple the eigenspaces of
$$M = \begin{bmatrix} 2 & -1 \\ 1 & 2 \end{bmatrix}$$
.

$$P_{n}(\lambda) = de + \begin{bmatrix} 2-\lambda & -1 \\ 1 & 2-\lambda \end{bmatrix} = (2-\lambda)^{2} - (-1) = (\lambda-2)^{2} + 1$$

which has nots
$$\lambda = 2 \pm i$$
, two complex eigenvalues.

$$\underline{\lambda = 2 + i}: RREF(M - (2 + i)I) = RREF\begin{bmatrix} -i & -1 \\ i & -i \end{bmatrix} = \begin{bmatrix} 1 & -i \\ 0 & 0 \end{bmatrix},$$

$$So \begin{bmatrix} x \\ y \end{bmatrix} \in null(M - \lambda I) \iff x - iy = 0 \iff \begin{cases} x = it \\ y = t \end{cases}$$

and
$$V_{2+i} = Span \left\{ \begin{bmatrix} i \\ i \end{bmatrix} \right\}$$
 as a complex vector space.

$$\lambda = 2 - i$$
: RREF(M-(2-i)I) = RREF[$i - i$] = [$i \circ i$],

So
$$\begin{bmatrix} x \\ y \end{bmatrix} \in n \text{ and } \begin{bmatrix} M - \lambda I \end{bmatrix} \iff x + iy = 0 \iff \begin{cases} x = -it \\ y = t \end{cases}$$

and
$$V_{2-i} = Span \left\{ \begin{bmatrix} -i \\ i \end{bmatrix} \right\}$$
 as a complex vector space.

NB: The previous examples had all eigenvalues distinct, so this was somewhat special. Indeed, the next few examples are more generic.

V

Ex: Compute the eigenspaces of
$$M = \begin{bmatrix} 1 & 0 & 2 \\ 0 & 3 & 0 \\ 2 & 0 & 1 \end{bmatrix}$$
.

Sol:
$$\rho_{M}(\lambda) = dit (M - \lambda T)$$

$$= dit \begin{bmatrix} 1-\lambda & 0 & 2 \\ 0 & 3-\lambda & 0 \\ 2 & 0 & 1-\lambda \end{bmatrix}$$

$$= (1-\lambda) dit \begin{bmatrix} 3-\lambda & 0 \\ 0 & 1-\lambda \end{bmatrix} - 0 + 2 dit \begin{bmatrix} 0 & 3-\lambda \\ 2 & 0 \end{bmatrix}$$

$$= (1-\lambda) ((3-\lambda) (1-\lambda) - 0) + 2 (0-2(3-\lambda))$$

$$= (3-\lambda) ((1-\lambda)^{2} - 4)$$

$$= -(\lambda-3) ((\lambda-1)^{2} - 2^{2})$$

$$= -(\lambda-3) ((\lambda-3) (\lambda+1))$$

$$= -(\lambda+1) (\lambda-3)^{2}$$

:. have eigenvalues $\lambda = -1$, $\lambda = 3$

$$\underline{\lambda = -1}: RREF(M+I) = RREF\begin{bmatrix} 2 & 0 & 2 \\ 0 & 4 & 0 \\ 2 & 0 & 2 \end{bmatrix} = \begin{bmatrix} 1 & 0 & 17 \\ 0 & 1 & 0 \\ 0 & 0 & 0 \end{bmatrix},$$

Hence
$$\begin{bmatrix} x \\ y \end{bmatrix} \leftarrow null (M+I) \Leftrightarrow \begin{cases} x + z = 0 \\ y = 0 \end{cases} \Leftrightarrow \begin{cases} x = -t \\ y = 0 \end{cases}$$

 $y : \text{elds} \quad V_{-1} = null (M+I) = Span \begin{cases} \begin{bmatrix} -1 \\ 0 \end{bmatrix} \end{cases}$.

$$\sum = 3 : RREF(M-3I) = RREF\begin{bmatrix} -2 & 0 & 2 \\ 0 & 0 & 0 \\ 2 & 0 & -2 \end{bmatrix} = \begin{bmatrix} 1 & 0 & -1 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix},$$

$$So \begin{bmatrix} x \\ y \\ z \end{bmatrix} \in Null(M-3I) \iff x-z=0 \iff \begin{cases} x = -t \\ y = s \\ z = t \end{cases} \iff \begin{bmatrix} x \\ y \\ z \end{bmatrix} = t \begin{bmatrix} -1 \\ 0 \\ 1 \end{bmatrix} + s \begin{bmatrix} 0 \\ 1 \\ 0 \end{bmatrix},$$

Hence $V_3 = n_0 || (M - 3I) = 5 pm \left\{ \begin{bmatrix} -1 \\ 0 \\ 1 \end{bmatrix}, \begin{bmatrix} 6 \\ 0 \\ 0 \end{bmatrix} \right\}$

In closing note $dim(V_{-1})=1$ while $dim(V_3)=2$.

1/1

$$Ex$$
: Compute eigenspaces of $M = \begin{bmatrix} \pi & 1 & 0 \\ 0 & \pi & 0 \\ 0 & 0 & \pi \end{bmatrix}$

Sol:
$$p_n(\lambda) = det (M-\lambda I) = det \begin{bmatrix} \pi-\lambda & 1 & 0 \\ 0 & \pi-\lambda & 0 \\ 0 & 0 & \pi-\lambda \end{bmatrix} = (\pi-\lambda)^3$$
.
Hence we have one eigenspace, for eigenvalue $\lambda = \pi$.

$$\underline{\lambda = \pi: RREF(M-\pi I) = RREF\begin{bmatrix}0 & 1 & 0\\ 0 & 0 & 0\\ 0 & 0 & 0\end{bmatrix} = \begin{bmatrix}0 & 1 & 0\\ 0 & 0 & 0\\ 0 & 0 & 0\end{bmatrix}}, s.$$

$$\begin{bmatrix} x \\ y \\ z \end{bmatrix} \in \text{noll} \left(M - \pi I \right) \iff y = 0 \iff \begin{cases} x = s \\ y = s \\ z = t \end{cases} \iff \begin{bmatrix} x \\ y \\ z \end{bmatrix} = se_1 + te_3$$

Hence Vm = span {e,, e3}.

Note that the dimensions of the eigenspaces were somewhat off-the-walls in the previous few examples. Indeed, we will want to study this somewhat closely for what is to come.

To begin, let's have a definition.

Defn: Let x be an eigenvalue of M.

The algebraic multiplicity of κ is the power of $(\lambda-\kappa)$ present in the factoritation of $P_m(\lambda)$.

(2) The geometric multiplicity of x is the dimension of Vx.

First me make a simple observation.

Prop: Let & be an eigenvalue of M. The geometric multiplizity of x is at least 1 and at most the algebraic multiplity of X.

Q: Why care?

A: Before we sow Vx n Vp = {0,} unless x=B. This implies that if Ba E Va and Bp EVp are bases, then Bx UBp is independent in V. As such, geometric multiplicity will tell us if U has a basis of eigenvertures. Propi Let M be an nxn matrix. (D) the degree of Pn(x) is n. 2) Rn has a basis of eigenvectors of M if and only if the geometriz multiplizity of every eigenvalue is equal to its algebraic multiplicity. Recall that matrices A and B are similar when there is an invertible metrix P such that B=P'AP. We Say matrix M is diagondizable when there is a diagonal matrix D which is similar to M. Prop (Diagonalizability (riterion) Let M be an nxu matrix. The following are equivalent. DM is diagonalizable. 1 Each eigenvalue of M has equal algebraic and geometric multiplicity. 3 Rn has a basis B in which every vector of B Construction: to diagondize M: D Compute Pm(X) and eigenvalues of M. 2) Compute a basis of the eigenspace of each eigenvalue. Ly If $dim(V_x)$ is less than the algebraic multiplicity of x, then STOP (it's not possible). 3 Consider B = B, UB, U ... UB, where $\lambda_1 < \lambda_2 < \cdots < \lambda_K$ are the eigenvalues of M and Briss a basis of Vri for all i. 1 Let P = Rep (id), so P'= Rep En, B (id). Then D = P"MP is diagonal (if step 2 did not fail).